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# Theoretical study of equilibrium and nonequilibrium exciton dynamics in disordered semiconductors

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We develop a temperature-dependent theory for singlet exciton hopping transport in disordered semiconductors. It draws on the transport level concept within a Förster transfer model and bridges the gap in describing the transition from equilibrium to nonequilibrium time-dependent spectral diffusion. We test the validity range of the developed model using kinetic Monte Carlo simulations and find agreement over a broad range of temperatures. It reproduces the scaling of the diffusion length and spectral shift with the dimensionless disorder parameter and describes in a unified manner the transition from equilibrium to nonequilibrium to nonequilibrium to nonequilibrium to nonequilibrium transport regime. We find that the diffusion length in the nonequilibrium regime does not scale with the the third power of the Förster radius. The developed theory provides a powerful tool for interpreting time-resolved and steady state spectroscopy experiments in a variety of disordered materials, including organic semiconductors and colloidal quantum dots.

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#### I. INTRODUCTION

The phenomenon of exciton diffusion is found to play a 21 role in a remarkably wide range of physical systems, includ-22 ing disordered organic semiconductors [1,2], nanocrystalline 23 quantum dots [3-6], semiconducting carbon nanotubes [7-10], 24 and photosynthetic biological systems [11]. Moreover, there is 25 a growing interest in describing electronic excitation energy 26 27 transfer because exciton dynamics determines function in many technological applications. For example, in thin-film 28 organic solar cells, exciton diffusion drives charge separa-29 tion [12,13], in organic light emitting diodes it determines 30 the brightness and color of the device [14], in scintillator 31 detectors it controls the response function and yield [15], 32 while in quantum communication systems it facilitates photon 33 antibunching [16]. 34

In disordered semiconductors that display weak intermolec-35 ular interactions, excitations created upon light absorption, 36 carrier recombination, or annihilation processes are typically 37 Frenkel excitons that are localized on single chromophore 38 units (molecule, conjugated segment, quantum dot) and have 39 a finite lifetime before relaxation to the ground electronic 40 state occurs by radiative or nonradiative process. In the weak 41 coupling regime, excitons transfer from one unit to the other 42 with a Markovian incoherent hopping process and transport 43 can be described as a simple diffusive motion [17]. However, 44 chromophore units are not equivalent to each other as they can 45 have different on-site excitation energies due to the different 46 local environment, structure, or size as well as different 47 excitonic couplings with neighbors. As a consequence, the 48

energy landscape has a distribution that is often approximated 49 by a Gaussian [18] and the standard deviation of the distribution 50 defines the disorder parameter  $\sigma$ . Therefore, in the course 51 of time, excitations sample the energetic landscape and on 52 average relax to lower energy sites until they "settle down" to 53 a steady state and equilibrium is achieved. However, because 54 excitations have a finite lifetime  $\tau$ , the relaxation process 55 might be incomplete and, consequently, the exciton transport 56 out of equilibrium [19]. It should be emphasized that this 57 spectral relaxation process is different from the initial rapid 58 vibronic relaxation [20]. Another consequence of the finite 59 lifetime is that excitations have a limited spatial diffusion 60 range, determined by the diffusion length  $L_D$  [19,21,22]. Spec- 61 troscopic techniques such as time-resolved and time-integrated 62 photoluminescence spectroscopy can provide information on 63 spectral diffusion [23-25] and a number of organic and inor- 64 ganic systems have been studied over a range of temperatures 65 [26-31]. 66

A common misconception exists, that in practical device 67 applications at room temperature, equilibrium transport pre-68 vails and the description of transport in terms of normal 69 diffusion is sufficient. However, the distinction between equi-70 librium and nonequilibrium exciton transport is quite a subtle 71 one and the transport regime is not uniquely defined only 72 by temperature. Whilst significant progress has been made 73 on understanding temperature dependent spectral relaxation 74 and exciton diffusion, including experimental measurements 75 [26-33] and computational models [19,21,33-44], currently 76 there is no analytical theory that can describe the transition 77 from equilibrium to nonequilibrium transport. In contrast, for 78 charges it has been suggested that the transport problem can 79 be modeled as a multiple-trapping process and it has been 80 shown that a unique level in the energy distribution exists, 81 the transport energy (TE), that plays the same role as the 82

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mobility edge in the multiple-trapping mechanism [45–47].
Note that in contrast to the long-range nature of the dipoledipole interaction facilitating singlet exciton transport [48],
charge transport in disordered semiconductors occurs via a
short-range tunneling mechanism [49].

In this paper, we shall develop and test a theory that can treat 88 the dynamics of exciton diffusion at both the equilibrium and 89 nonequilibrium transport regime. In what follows, we develop 90 a formalism based on the TE concept for the calculation of 91 singlet exciton transport parameters, such as relaxation energy 92 and diffusivity, including their temporal dependence. The 93 validity of the TE level concept for Förster processes has been 94 demonstrated by Baranovskii and Faber [50]. However, the TE 95 level concept has not been applied yet to describe temperature 96 and time dependent singlet exciton transport. In Sec. II, we 97 repeat the main arguments and equations of Ref. [50] to enable 98 the reader to follow theoretical consideration in Sec. III based 99 on these equations. Section III includes the main results (Secs. 100 III A, B, and E) along with a comparison of the theory to 101 Monte Carlo simulations (Sec. III C), a discussion on the TE 102 level concept for short vs long-range transfer and comparison 103 with experiments (Sec. III D). Section IV summarizes the work 104 and draws conclusions. 105

# II. TRANSPORT ENERGY LEVEL FOR FÖRSTER TRANSFER

<sup>108</sup> We consider thermally assisted Förster energy transfer <sup>109</sup> between localized states described by the rate [19,50,51]

$$\nu(\varepsilon_d \to \varepsilon_a) = \frac{1}{\tau} S(R) \exp\left[-\frac{\Delta \varepsilon + |\Delta \varepsilon|}{2k_{\rm B}T}\right],\tag{1}$$

110 with

$$S(R) = \left(\frac{R_{\rm F}}{R}\right)^6,\tag{2}$$

where  $\tau$  is the intrinsic exciton lifetime,  $R_{\rm F}$  is the Förster radius, determined by the donor-acceptor spectral overlap, and  $k_{\rm B}T$  is the thermal energy.  $\Delta \varepsilon = \varepsilon_a - \varepsilon_d$  is the difference between the donor and acceptor energies and R is the corresponding distance.

We take into account a Gaussian distribution of energy 116 states  $g(\varepsilon) = N/\sqrt{2\pi\sigma^2} \exp(-\varepsilon^2/2\sigma^2)$ , with N and  $\sigma$  the 117 total density of states (DOS) and the width of the distribution, 118 respectively. If the relaxation process is completed during the 119 lifetime  $\tau$ , excitons will occupy states around the equilibrium 120 energy  $\varepsilon_{\infty}$  (see Fig. 1) at which the product  $g(\varepsilon)f(\varepsilon, \varepsilon_F)$  max-121 imizes [49]. Here,  $f(\varepsilon, \varepsilon_F) = \{1 + \exp[(\varepsilon - \varepsilon_F)/k_BT]\}^{-1}$  is 122 the Fermi distribution and  $\varepsilon_F$  is the Fermi level, determined by 123 124 the number density *n* of the excitons as

$$n = \int_{-\infty}^{+\infty} g(\varepsilon) f(\varepsilon, \varepsilon_F) \mathrm{d}\varepsilon.$$
(3)

<sup>125</sup> Note that at low densities, the equilibrium energy  $\varepsilon_{\infty}$  can be <sup>126</sup> approximated by either  $-\sigma^2/k_{\rm B}T$ , at high temperatures [52], <sup>127</sup> or by  $\varepsilon_F$ , at low temperatures; see Fig. 2(a).

<sup>128</sup> Now, we examine the possibility of the existence of a TE <sup>129</sup> level  $\varepsilon_{tr}$  in the energy distribution that can serve as the mobility <sup>130</sup> edge in our exciton diffusion problem [50]. In the presence of <sup>131</sup> such an energy level, excitons with  $\varepsilon > \varepsilon_{tr}$ , will, on average,

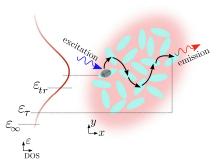


FIG. 1. Schematic illustration of interacting units in a disordered semiconductor, resulting in a Gaussian broadened excitonic DOS. Singlet exciton diffusion via Förster-type energy transfer process triggers energy relaxation toward the equilibrium energy  $\varepsilon_{\infty}$ . Due to the finite lifetime, excitons may decay at a higher energy,  $\varepsilon_{\tau}$ .  $\varepsilon_{tr}$  is the transport energy level.

move downward in the distribution, toward the TE level. On the other hand, upward jumps of excitons with  $\varepsilon < \varepsilon_{tr}$  will be in the vicinity of  $\varepsilon_{tr}$ . If we express the mean jump distance as is the mean jump distan

$$R_{\varepsilon_{tr}} = \left[\frac{4\pi}{3} \int_{-\infty}^{\varepsilon_{tr}} g(\varepsilon) f'(\varepsilon, \varepsilon_F) d\varepsilon\right]^{-1/3}, \tag{4}$$

we can obtain the following equation governing the position <sup>135</sup> of the TE level for the Förster transport problem: <sup>136</sup>

$$g(\varepsilon_{tr})f'(\varepsilon_{tr},\varepsilon_F) = \frac{1}{2k_{\rm B}T} \int_{-\infty}^{\varepsilon_{tr}} g(\varepsilon)f'(\varepsilon,\varepsilon_F) \mathrm{d}\varepsilon, \quad (5)$$

where  $f'(\varepsilon, \varepsilon_F) = 1 - f(\varepsilon, \varepsilon_F)$ . We have used the approach <sup>137</sup> of Ref. [46] to obtain the above equation, according to which 138 one can find  $\varepsilon_{tr}$  by maximizing the upward transfer rate; see 139 Appendix A for more details. We emphasize that the form of 140 Eq. (5) directly follows from the inverse *sixth* power distance 141 dependence of the dipole-dipole interaction. Equation (5) also 142 shows that the position of  $\varepsilon_{tr}$  is independent of the characteristic length  $R_{\rm F}$  and the density N, in contrast to the charge 144 transport problem in which  $\varepsilon_{tr} = \varepsilon_{tr}(\alpha, N)$ . Interestingly, 145 Eq. (5) does not acquire a solution for an exponential DOS. Again, this is in contrast to the charge transport problem, where 147 for both Gaussian and exponential DOS one can find a TE 148 level in the energy distribution. Charge transport in disordered 149 semiconductors occurs via short-range transfer mechanism, 150 with a rate similar to Eq. (1), but with  $S(R) = \exp(-2R/\alpha)$ , 151 where  $\alpha$  is the carrier localization length. 152

Figure 2(a) illustrates  $\varepsilon_{tr}$  as a function of disorder normalized thermal energy. At high temperatures,  $\varepsilon_{tr}$  lies near the center of the energy distribution. At lower temperatures,  $\varepsilon_{tr}$  decreases to lower energies because by decreasing the temperature thermal activation to higher energies becomes less probable. We point out that a meaningful application of the TE level requires that the condition  $\varepsilon_{tr} > \varepsilon_{\infty}$  [49] is satisfied. To test this condition, we plot a heat map of  $\varepsilon_{tr} - \varepsilon_{\infty}$  as a function of  $k_{\rm B}T/\sigma$  and excitation density in Fig. 2(b), which shows that this condition is fulfilled over a broad range of temperatures and exciton densities. Thus the concept of the TE can be used for Förster-type exciton transport. In what follows, we consider the weak excitation condition, with  $n/N \ll 1$  and therefore  $f' \approx 1$ . More precisely, we use  $\sigma = 0.065$  eV, N = 1 nm<sup>-3</sup> and 166

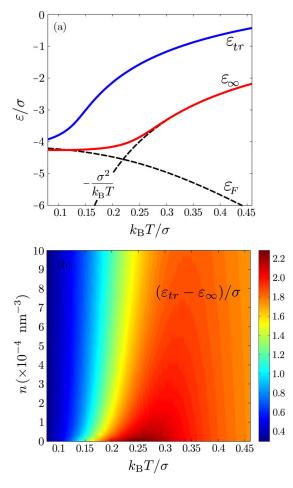


FIG. 2. (a) Transport energy level  $\varepsilon_{tr}$ , as a function of disorder normalized temperature. Data are obtained using Eq. (5) with  $\sigma =$ 0.065 eV,  $N = 1 \text{ nm}^{-3}$ , and  $n/N = 1.6 \times 10^{-5}$ .  $\varepsilon_F$  is the Fermi level and  $\varepsilon_{\infty}$  is the thermal equilibrium energy, approaching  $-\sigma^2/k_{\rm B}T$  at high temperatures. (b) Heat map of  $\varepsilon_{tr} - \varepsilon_{\infty}$  for a broad range of temperatures and exciton densities.

<sup>167</sup>  $n/N = 1.6 \times 10^{-5}$ , corresponding to one exciton in a lattice <sup>168</sup> of size (40 nm)<sup>3</sup>, as implemented in our kMC simulations. The <sup>169</sup> same parameters were used in Fig. 2(a).

### 170 III. NONEQUILIBRIUM EXCITON DYNAMICS

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## A. Demarcation energy level and energy relaxation

Having outlined the concept of the TE level and the gov-172 erning equations for singlet exciton transport [50], let us now 173 turn our attention to the main problem, that is, the description 174 of the relaxation dynamics. Excitons, generated randomly 175 in the DOS, progressively thermalize into deeper energies. 176 Notwithstanding their way to the deep energy levels, excitons 177 need to be first activated to shallower energies, because the 178 density of such levels is high in the energy distribution. Using 179 the concept of the TE level we can say that these intermediate 180 activations, necessary to approach thermal equilibrium, are 181 most probable at the vicinity of the level  $\varepsilon_{tr}$ . As first introduced 182 by Tiedje and Rose [53], we can define a demarcation energy 183  $\varepsilon_m(t)$  in the system, such that during time t following the initial 184 excitation, only the levels with  $\varepsilon > \varepsilon_m(t)$  are likely to release 188

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their excitons to the TE level. Mathematically, this means that  $_{186}$  $t\nu(\varepsilon_m \rightarrow \varepsilon_{tr}) = \theta$ , with  $\theta$  being  $\mathcal{O}(1)$ . In a more explicit form,  $_{187}$ 

$$t\frac{1}{\tau}\left(\frac{R_{\rm F}}{R_{\varepsilon_{tr}}}\right)^{6}\exp\left[-\frac{\varepsilon_{tr}-\varepsilon_{m}(t)}{k_{\rm B}T}\right]=\theta.$$
 (6)

From the above equation we find

$$\varepsilon_m(t) = \varepsilon_{tr} - k_{\rm B}T \ln\left[\frac{t}{\theta\tau} \left(\frac{R_{\rm F}}{R_{\varepsilon_{tr}}}\right)^6\right].$$
 (7)

On the other hand, if we consider the low density condition, we 189 can obtain the following equation for the mean jump distance 190 from Eqs. (4) and (5): 191

$$\frac{1}{R_{\varepsilon_{tr}}^3} = \frac{8\pi}{3}g(\varepsilon_{tr})k_{\rm B}T.$$
(8)

Inserting Eq. (8) in Eq. (7), and using  $g(\varepsilon) = N/_{192}$  $\sqrt{2\pi\sigma^2} \exp(-\varepsilon^2/2\sigma^2)$ , we get the following expression for  $_{193}$ the demarcation level: 194

$$\varepsilon_m(t) = \varepsilon_{tr} \left( 1 + \frac{\varepsilon_{tr}}{\sigma^2 / k_{\rm B} T} \right) - k_{\rm B} T \ln \left[ \left( N_{\rm F} \frac{k_{\rm B} T}{\sigma} \right)^2 \frac{2}{\theta \pi} \frac{t}{\tau} \right],\tag{9}$$

where  $N_{\rm F} = (4\pi/3)R_{\rm F}^3 N$ .

According to Eq. (9), in the course of time, the demarcation 196 level sinks to deeper energies. However, we note that this can 197 continue only until time  $t = \tau$ , which is the intrinsic lifetime 198 of the exciton. If we interpret the demarcation energy as a 199 quasi-Fermi level [54], at time  $\tau$  most excitons are accumulated 200 around an energy level at which the product  $g(\varepsilon) f[\varepsilon, \varepsilon_m(\tau)]$  201 maximizes. This energy is in fact the same energy  $\varepsilon_{\tau}$  shown 202 in Fig. 1.  $\varepsilon_{\tau}$  is in general different from  $\varepsilon_{\infty}$ , but if the 203 thermalization is completed during the exciton lifetime, we 204 obtain  $\varepsilon_{\tau} = \varepsilon_{\infty}$ . The energy,  $\varepsilon_{\tau}$  is experimentally available 205 through fluorescence spectroscopy. We stress that our model 206 can also be applied for exciton transport in the presence of 207 quenching centers [21,55]. In such a situation, one has to 208 consider the demarcation energy at time  $t < \tau$ .

The five energy levels discussed here,  $\varepsilon_{tr}$  (TE level),  $\varepsilon_{\tau}$  (energy relaxation during exciton lifetime),  $\varepsilon_m(\tau)$  (demarcation 211 or quasi-Fermi level at time  $t = \tau$ ),  $\varepsilon_{\infty}$  (thermal equilibrium 212 energy), and  $\varepsilon_F$  (equilibrium Fermi level), are plotted in Fig. 3 213 for  $R_F = 5$  nm. We have used  $\theta \approx 0.2$  since it gives excellent 214 agreement with kinetic Monte Carlo (kMC) simulations, see 215 below. As expected, at high disorder normalized temperatures 216 the thermalization is nearly complete, and therefore  $\varepsilon_{\tau}$  coincides with  $\varepsilon_{\infty}$ . However, by decreasing  $k_B T/\sigma$ ,  $\varepsilon_{\tau}$  deviates 218 from  $\varepsilon_{\infty}$ , owing to the incomplete thermalization during the 219 exciton lifetime. 220

Two temperature regions in Fig. 3 need to be discussed in <sup>221</sup> detail. (i) Region with  $\varepsilon_m(\tau) > \varepsilon_\infty$ . The relaxation energy  $\varepsilon_\tau$  in <sup>222</sup> this region reaches a minimum at a critical temperature where <sup>223</sup>  $\varepsilon_m(\tau) \approx \varepsilon_\infty$ , and then *increases* by decreasing the temperature, <sup>224</sup> see inset of Fig. 3. This behavior, usually assigned to frustrated <sup>225</sup> relaxation, has been observed experimentally [30,31], and has <sup>226</sup> been predicted through kMC simulations to occur also for <sup>227</sup> Förster energy transfer [38]. Here, we see that our model <sup>228</sup> can naturally produce the frustrated relaxation feature, see <sup>229</sup> Sec.IIID for more details. (ii) Region with  $\varepsilon_m(\tau) > \varepsilon_{tr}$ . In the <sup>230</sup>

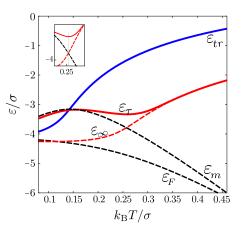


FIG. 3.  $\varepsilon_{tr}$  (TE level),  $\varepsilon_{\tau}$  (energy relaxation during the exciton lifetime),  $\varepsilon_m(\tau)$  (quasi-Fermi level),  $\varepsilon_{\infty}$  (thermal equilibrium energy), and  $\varepsilon_F$  (equilibrium Fermi level), as a function of disorder normalized temperature. Data are calculated using Eqs. (5) and (9) for  $R_F = 5$  nm.

temperature region given by the above condition, the multiple-231 trapping model is not applicable at all and introducing  $\varepsilon_m(\tau)$  is 232 physically meaningless. In this region, excitons created in the 233 system move, on average, downward toward the TE energy 234 level, and therefore the picture of activation to a TE level 235 is not correct. As we discuss below in the kMC section, an 236 agreement between theory and simulation is not expected in 237 this temperature region. 238

An important feature of the Förster-type transport mech-239 anism is that the exciton transfer rate is coupled to the 240 spontaneous decay rate,  $1/\tau$ ; see Eq. (1). Therefore, a longer 241 exciton lifetime does not result in a higher degree of the 242 thermalization, because the transfer rate, that determines the 243 degree of thermalization, is also reduced. As a consequence, as 244 predicted by Eq. (9), the demarcation energy at time  $t = \tau$ , and 245 hence  $\varepsilon_{\tau}$ , are independent of the exciton lifetime. On the other 246 hand,  $\varepsilon_{\tau}$  is a strong function of the Förster radius. We discuss 247 this dependency below, when presenting the kMC simulation 248 results. 249

#### B. Exciton diffusion length

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An important physical quantity related to exciton transport is the diffusion length. In what follows, we derive an expression for the exciton diffusion length using the TE level concept. Since the diffusion length is given by [56]

$$L_D = \sqrt{D\tau},\tag{10}$$

we must first find the diffusion coefficient D. To obtain this, one can use [57]

$$D \approx R_{\varepsilon_{tr}}^2 / \langle t \rangle, \tag{11}$$

<sup>257</sup> where  $\langle t \rangle$  is the mean time that excitons spend in an energy <sup>258</sup> state before activation to the TE level.  $\langle t \rangle$  can be obtained by <sup>259</sup> averaging the quantity  $1/\nu(\varepsilon \rightarrow \varepsilon_{tr})$  for energies smaller than 260

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 $\varepsilon_{tr}$  [57,58]:

$$\langle t \rangle = \tau \left(\frac{R_{\varepsilon_{tr}}}{R_{\rm F}}\right)^6 \frac{\int_{-\infty}^{\varepsilon_{tr}} \exp\left(\frac{\varepsilon_{tr} - \varepsilon}{k_{\rm B}T}\right) g(\varepsilon) f'[\varepsilon, \varepsilon_m(\tau)] d\varepsilon}{\int_{-\infty}^{\varepsilon_{tr}} g(\varepsilon) f'[\varepsilon, \varepsilon_m(\tau)] d\varepsilon}.$$
(12)

Combining Eqs. (10)–(12), as shown in Appendix B, we get the following expression for the diffusion length:

$$L_D \approx \left(\frac{9\theta^3}{16\pi^2} \frac{N' - n'}{n'^3}\right)^{1/6},$$
 (13)

where  $n' = \int_{-\infty}^{\varepsilon_{tr}} g(\varepsilon) f[\varepsilon, \varepsilon_m(\tau)] d\varepsilon$  and  $N' = \int_{-\infty}^{\varepsilon_{tr}} g(\varepsilon) d\varepsilon$ . 263 Note that, since according to Eq. (9)  $\varepsilon_m(\tau)$  is a function of the 264 Förster radius  $R_{\rm F}$ , the diffusion length is also  $R_{\rm F}$  dependent. 265 However, it is clear from Eq. (13) that the dependency of  $L_D$  <sup>266</sup> on  $R_{\rm F}$  is more complex than that traditionally expected, that 267 is,  $L_D \propto \sqrt{D} \propto \sqrt{\nu} \sim R_{\rm F}^3$  (which is deduced from a simple 268 nearest neighbor random walk picture). This is because, for 269 the problem of exciton transport in energetically disordered 270 systems,  $R_{\rm F}$  is not merely a multiplicative factor, but according 271 to Eq. (9), it also controls the thermalization process, which, in 272 turn, affects the dispersivity of the diffusion process. Another 273 important result of our theory, as discussed in Appendix C, 274 is that both the quantity  $\varepsilon_{\tau}/\sigma$  and the diffusion length  $L_D$  in 275 Eq. (13) scale with the dimensionless disorder strength  $\sigma/k_{\rm B}T$ . 276 Indeed, the scaling of both the exciton diffusion length and 277 spectral relaxation has been predicted in the past by one of 278 the authors using Monte Carlo simulations [19,39,59]. In the 279 following section, we test the validity of our approach to the 280 problem of nonequilibrium exciton transport against Monte 281 Carlo simulations. 282

#### C. Kinetic Monte Carlo simulations

Monte Carlo simulations provide an insightful and predictive computational method for studying incoherent hopping transport phenomena in disordered semiconductors. In this paper, we use a kMC method [19] to simulate the time evolution of singlet exciton transport, confirm the validity of the developed theoretical model and test its applicability range. The computational protocol is as follows.

We consider a regular cubic cell of  $40 \text{ nm} \times 40 \text{ nm} \times 40 \text{ nm}$  291 with a lattice constant a = 1 nm. Each lattice point corresponds 292 to an exciton transport site, while periodic boundary conditions 293 are implemented along all directions of the cell using the 294 minimum image criterion. Individual Monte Carlo runs start 295 by placing one exciton at a random site in the cell with each 296 site having an energy drawn from a Gaussian distribution with 297 a zero mean and variance  $\sigma^2$ . Förster transfer rates  $v_{ij}$  from 298 the exciton occupied site i to each neighboring hopping site 299 *j*, within a cutoff radius of  $r_{\text{cut}} = 5 \text{ nm}$ , are calculated using 300 Eq. (1). At each Monte Carlo step, waiting times for each 301 hopping event are calculated according to  $\tau_{ij} = -\frac{1}{v_{ij}} \ln X$ , with 302 X a random number from a box distribution from zero to  $_{303}$ unity, resulting in 514 events for the chosen cutoff radius. An 304 additional waiting time for exciton recombination is computed 305 as  $\tau_{ir} = -\tau \ln X$ . If the event with the shorter waiting time 306 is a hopping event, then exciton transfers to the new site and 307

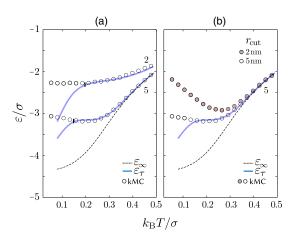


FIG. 4. (a) Energy relaxation during the exciton lifetime,  $\varepsilon_{\tau}$  as a function of disorder normalized temperature. kMC simulations (circles) and theory (solid lines), for two different Förster radii,  $R_{\rm F} = 2$  and 5 nm. The critical points at which  $\varepsilon_m(\tau) = \varepsilon_{tr}$ , are indicated as segments. Dashed line indicates the thermal equilibrium energy  $\varepsilon_{\infty}$ . (b) Same as (a) with  $r_{\rm cut} = 5$  nm (empty circles) and 2 nm (filled circles).

simulation advances whereas if it is recombination, the exciton 308 is removed from the system and the run is terminated. By 309 averaging over  $10^5$  individual exciton trajectories, we obtain 310 the quantities of interest, i.e., the relaxation energy  $\varepsilon_{\tau}$  and 311 the diffusion length  $L_D$ . The first is calculated from the final 312 energy of each exciton before recombination, while the latter 313 from the displacement between the initial, exciton generation, 314 and the final, exciton recombination, position. We allow to 315 vary independently the temperature T and Förster radius  $R_F$ 316 parameters, while disorder  $\sigma$  and lifetime  $\tau$  remain constant. 317 In fact, due to the Förster rate inverse dependence on  $\tau$ ,  $\tau$  does 318 not impact neither the  $\varepsilon_{\tau}$  nor the  $L_D$  values, while a scaling 319 law exists for both of them with respect to the dimensionless 320 disorder parameter  $\sigma/k_{\rm B}T$  [19,38]. 32

The central results comparing theory with Monte Carlo simulations are presented in Fig. 4 for the spectral relaxation and Fig. 5 for the diffusion length. Figure 4(a) shows the Monte

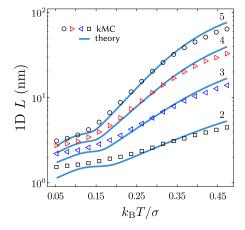


FIG. 5. Diffusion length  $L_D$  as a function of disorder normalized temperature. Data from kMC simulation (symbols) and theory (solid lines), for different Förster radii,  $R_F = 2$ , 3, 4, and 5 nm.

Carlo results for  $\varepsilon_{\tau}$ , for two Förster radii  $R_{\rm F} = 2$  and 5 nm. The 325 theoretical predictions, calculated based on the TE concept 326 and using the averaging method (see Appendix D), are also 327 shown in the figure. As pointed out above in Fig. 4(a), the 328 multiple-trapping picture is not valid when  $\varepsilon_m(\tau) > \varepsilon_{tr}$ . The 329 exact points at which  $\varepsilon_m(\tau) = \varepsilon_{tr}$  are calculated and marked in 330 the figure. In the region where the TE concept is applicable, the 331 theory is in very good agreement with the kMC results. Since 332 the density of the energy levels is higher near the center of the 333 Gaussian distribution, most excitons generated in the system 334 will have energies  $\varepsilon \approx 0$  and according to the TE concept, those 335 excitons initially move, on average, downward to the TE level 336  $\varepsilon_{tr}$ . However, en route to the TE level, some upward in energy jumps are also necessary to avoid the blockade of excitons due 338 to disorder. Therefore, for larger Förster radii, the TE concept 339 is valid over a broader range of temperatures, because a larger 340  $R_{\rm F}$  results to a higher probability to overcome local energy 341 barriers. 342

A recent combined experimental and computational study 343 highlighted the dominant contribution of long-distance jumps 344 to singlet exciton migration in metal-organic frameworks [60]. 345 To illustrate the importance of long-distance hopping, we have 346 also performed simulations with  $r_{\rm cut} = 2 \text{ nm}$  (i.e., restrict- 347 ing exciton hopping only to the first 32 nearest neighbors). 348 Figure 4(b) shows that in comparison to  $r_{\rm cut} = 5 \text{ nm}$  (514 349 nearest neighbors), the energy relaxation shows a pronounced 350 frustrated dynamics, inconsistent with the theory prediction. 351 This clearly demonstrates that especially at low temperatures, 352 long-range jumps contribute significantly to the relaxation 353 process. In other words, due to the long-range nature of the 354 Förster mechanism, modeling the singlet exciton transport as 355 a simple nearest-neighbor random walk process may result 356 in an incorrect description of the energy transfer dynamics. 357 We can also conclude that for inherently short-range transport mechanism, like charge or triplet exciton transport problem, 359 a strong frustration is expected, as indeed reported in earlier 360 simulations [38,39]. We revisit this issue in more detail in Sec. 361 **IIID**, below. 362

Figure 5 compares  $L_D$  obtained from the kMC simulations 363 with those calculated using Eq. (13). Apart from an additional 364 constant factor ( $\approx 1.5$ ) needed to fit the theory to the simulation  $_{365}$ (see Sec. IIIE), the theoretical results are in good agreement 366 with the kMC simulations showing a steep increase of the 367 diffusion length with disorder normalized thermal energy. 368 We point out that in contrast to spectral relaxation, reliable 369 estimates for  $L_D$  from the theoretical model can be obtained 370 even in the regime where  $\varepsilon_m(\tau) > \varepsilon_{tr}$  as  $L_D$  is less sensitive 371 to  $\varepsilon_m(\tau)$  in that region. It must be noted that our results are 372 in agreement with experimental reports on the temperature 373 dependence of the exciton diffusion length [29,32]. Finally, 374 Fig. 6 shows that the traditional picture of  $L_D \propto R_F^3$  does not 375 hold true at the intermediate and low temperature region, as 376 predicted and discussed in the theory section above. 377

# D. TE level for short vs long-range transfer and comparison with experiment

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Herein, we discuss the main differences on the TE level 380 for short vs long-range excitation transfer and the resulting 381 influence on energy relaxation. We also include a comparison 382

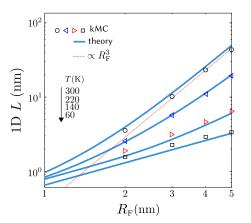


FIG. 6. Diffusion length  $L_D$  as a function of the Förster radius for different temperatures on a log-log scale. Data from kMC simulations (symbols) and theory (solid lines). Dashed line indicates the slope expected from  $L_D \propto R_{\rm F}^3$ .

383 with published experimental data of temperature dependent fluorescence relaxation in organic semiconductors. Although 384 in this paper we have focused on the hopping dynamics of 385 singlet excitons that transfer by a Förster process, i.e., with a 386 long-range transfer rate that is  $\propto \tau^{-1} (R_{\rm F}/R)^6$ , within a Gaus-387 sian DOS, of particular interest is also the relaxation process 388 of charge carriers and triplet excitons that follow a Dexter 389 type of transfer mechanism. This short-range transfer process 390 requires wave-function overlap and can be described by a 391 Miller-Abrahams (MA) type of rate  $\propto v_0 \exp(-2R/\alpha)$ . An 392 important difference between those two transfer mechanisms 393 is that whilst for Förster transfer, exciton transport and decay 394 are coupled to each other, due to the inverse dependence of the 395 rate on the exciton lifetime  $\tau$ , for MA transfer the attempt to 396 hop frequency prefactor  $v_0$  is independent of the lifetime, with 397 typically  $\tau \gg \nu_0^{-1}$ . 398

The TE level has been used before to study energy relaxation 399 of charges and triplet excitons that transfer by short-range 400 hopping rate transfer [34,53,61]. Motivated by experimental 401 observations of photoluminescence spectra [30,31] that show 402 a nonmonotonic dependence of the relaxation energy upon 403 cooling, those studies along with kMC simulations [34,38,39] 404 have revealed that charges and triplet excitons show a strong 405 frustrated relaxation, of the order of a few  $\sigma$ , as depicted 406 schematically in Fig. 7(a). To describe this behavior, we first 407 note that the TE level for short-range transfer (MA rate) 408 [47,62] lies above the TE level for Förster transfer across the 409 intermediate and low temperature range, as shown in Fig. 7(b). 410 We highlight that for MA transfer,  $\varepsilon_{tr}$  is a function of disorder 411 normalized thermal energy  $k_{\rm B}T/\sigma$ , exciton density N, and 412 localization length  $\alpha$  and is independent of  $v_0$ . For Förster 413 transfer, however,  $\varepsilon_{tr}$  is only a function of  $k_{\rm B}T/\sigma$  and is inde-414 pendent of N,  $R_{\rm F}$ , and  $\tau$ . The relative position of the pertinent 415 TE levels is therefore valid for any combination of transport 416 parameters, unless for very large, unrealistic values of  $\alpha$ . 417 According to the multiple-trapping picture, upward excitation 418 419 hops are mainly at the vicinity of the TE level. Henceforth, for 420 short-range MA transfer, with decreasing thermal energy such

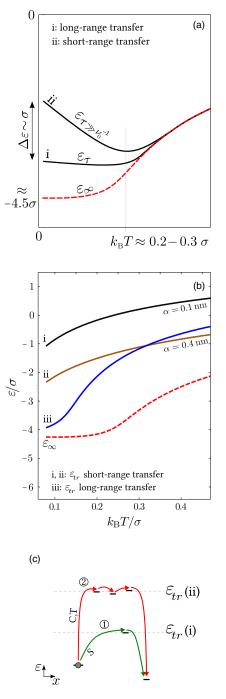


FIG. 7. (a) Illustration of temperature-dependent energy relaxation for long- vs short-range transfer processes. Short-range transfer (relevant for charges and triplet excitons) results in a strong frustration, of the order of  $\sigma$  at low temperatures. (b) Relevant ordering of temperature-dependent TE levels for long-range (Förster rate) and short-range (MA rate) transfer for typical transport parameters. (c) Schematic illustration showing the different relaxation pathways for charges and triplet excitons (C,T) and singlet excitons (S). The TE level for long-range transfer, i, lies below the TE level for short-range transfer, ii. Paths (1) and (2) result to relaxation toward deep energy levels. At intermediate and low temperatures, however, thermal activation via path (2) is forbidden, leading to frustrated relaxation.

hops are less probable and the relaxation process terminates at 421 higher energies, because intermediate activations to the TE 422 level are necessary to reach the equilibrium level. This is 423 schematically shown in Fig. 7(c). On the other hand, since the 424 TE level for long-range Förster transfer is at lower energies, 425 thermal activations to this level are more likely and therefore 426 subsequent relaxation to deep energy levels is an allowed 427 process. Note that although for a Gaussian DOS, sites with 428 low energy levels are limited, the long-range nature of the 429 Förster rate makes upward energy jumps more probable for 430 singlet excitons [Path (1) in Fig. 7(c)]. It is well established that 431 for disordered organic semiconductors and colloidal quantum 432 dots, a Gaussian DOS describes the distribution of localized 433 energy states [18], whereas for inorganic semiconductors an 434 exponential DOS is a more appropriate choice [34,61,63,64]. 435 An important feature of the Gaussian DOS, in contrast to the 436 exponential one, is that for a broad temperature range the most 437 populated energy level ( $\varepsilon_{\infty}$  or  $\varepsilon_{\tau}$ ) does not lie near the Fermi 438 level ( $\varepsilon_F$  or  $\varepsilon_m$ ); see Fig. 3. Therefore, for calculating the 439 amount of the energy relaxation, we have used the energy 440  $\varepsilon_{\tau}$  and not the demarcation energy  $\varepsilon_m$ . For an exponential 441 DOS however, since  $\varepsilon_{\infty(\tau)} \simeq \varepsilon_{F(m)}$ , one can use the position 442 of the demarcation energy as the energy relaxation, as done in 443 Refs. [34,61] for short-range type of transfer in an exponential 444 445 DOS.

Finally, we compare our theoretical results for the energy 446 relaxation ( $\varepsilon_{\tau}$ ) based on the TE level formulation with previ-447 ously published experimental data in conjugated polymers and 448 oligomers. Figure 8 shows experimental data obtained from 449 the fluorescence spectra of four different films: dioctyloxy-450 poly(p-phenylene) (DOOPPP), polyfluorene (PF2/6), ladder-451 type poly(*p*-phenylene) (MeLPPP), and PF2/6 trimer (Trimer) 452 as reported in Refs. [30,38]. It is evident that the theory 453 reproduces the experimental data for reasonable Förster radii 454 (best fits are obtained with  $R_{\rm F} = 2.5$  and 4.5 nm, as indicated 455 in the figure). Note that according to Eq. (9), the quantity  $NR_{\rm F}^3$ 456 is the fit parameter. Here, however, we have decided to fix the 457 total density of states ( $N = 1 \text{ nm}^{-3}$ ) and only vary the Förster 458 radius to obtain the above data. In Fig. 8, in addition to  $\varepsilon_{\tau}$ , 459 we also display  $\varepsilon_{\infty}$  (energy relaxation at equilibrium) and the 460 quantity  $-\sigma^2/k_{\rm B}T$ . Interestingly, the equilibrium quantity  $\varepsilon_{\infty}$ 461 fits the experimental data for the DOOPPP polymer over the 462 whole temperature range, showing that singlet excitons reach 463 equilibrium conditions during their lifetime. This, in turn, is 464 a result of the high density of localized states, a large Förster 46 radius, or a combination of these two factors. 466

#### 467

#### E. Subdiffusive transport

Having established the effectiveness of the analytical model 468 to describe spectral relaxation, we now turn our attention 469 to obtaining the time dynamics of exciton diffusion. Very 470 recently, it has been reported experimentally that exciton 471 diffusion in a system of disordered colloidal quantum dots is 472 dispersive and can be described as a subdiffusive transport 473 [3], in which  $D(t) \propto t^{\beta}$  with  $\beta < 0$ . Similar results have been 474 obtained from Monte Carlo simulations for triplet exciton and 475 charge transport in a Gaussian DOS [39,65]. To investigate 476 whether our model can explain these observations, we expand 477 the TE concept to take into account the time dependence of the 478

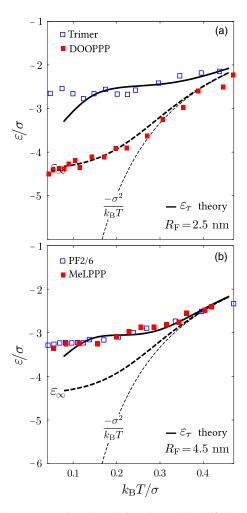


FIG. 8. Energy relaxation during the exciton lifetime,  $\varepsilon_{\tau}$  as a function of disorder normalized temperature. Theoretical data based on the TE level (solid line) and experimental data obtained from the fluorescence spectra of (a) PF2/6 trimer (empty squares) and DOOPPP polymer(filled squares) films (from Ref. [30]) and (b) PF2/6 (empty squares) and MeLPPP (filled squares) polymer films (from Ref. [38]). The Förster radii  $R_{\rm F}$  used in the calculations are indicated in the plots. The levels  $\varepsilon_{\infty}$  (thick dashed line) and  $-\sigma^2/k_{\rm B}T$  (thin dashed line) are also plotted.

dynamics for  $t < \tau$ . This can be achieved by considering 479 the demarcation energy  $\varepsilon_m(t)$ , instead of  $\varepsilon_m(\tau)$  used in the 480 previous calculations. Below, we present results for the energy 481 relaxation shift  $\varepsilon_{t \leq \tau}$  and the diffusion coefficient D(t), while 482 we derive the time-dependent expressions in Appendix B. 483

Figure 9 shows the temporal evolution of  $\varepsilon_{t \leq \tau}$  and D(t) for two different temperatures and two Förster radii,  $R_{\rm F} = 2$  and 5 nm. As seen in Fig. 9(a), in the course of time, excitons relax to lower energy levels. For a Förster radius of  $R_{\rm F} = 5$  nm and at high temperatures, excitons reach the equilibrium energy during their lifetime [this is also apparent in Fig. 4(a)] and a stationary state is indeed established at  $t < \tau$ . In contrast, at low temperatures and/or small Förster radius, the relaxation process is incomplete and the stationary state can not obtained. Interestingly, our theoretical results for low temperatures show a linear dependence with time in the logarithmic scale  $\varepsilon_{t \leq \tau} \sim -\ln(t/\tau)$ , with the same slope for both  $R_{\rm F} = 2$  and 495

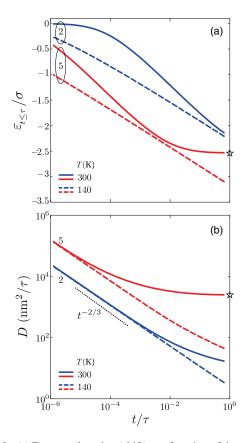


FIG. 9. (a) Energy relaxation (shift) as a function of time. Data for T = 140, and 300 K, and  $R_F = 2$  and 5 nm. (b) Diffusion coefficient D(t) as a function of time calculated using Eq. (B5). Data for T = 140 and 300 K and  $R_F = 2$  and 5 nm. The dotted line shows the scaling of the diffusion coefficient with time in the nonequilibrium regime. Stars indicate the equilibrium values.

5 nm, and are in agreement with results from Movaghar 496 et. al. [51]. The time evolution of the diffusivity is shown in 497 Fig. 9(b). As a result of exciton relaxation to lower energy 498 levels with time, based on the multiple-trapping picture, the 499 waiting time needed to jump to the TE level increases with time. 500 Therefore, the diffusion coefficient becomes time-dependent, 501 i.e., dispersive transport, and decreases with time. As derived 502 in Appendix B, in this nonequilibrium regime we obtain 503

$$D(t) \propto \left(\frac{t}{\tau}\right)^{-2/3},$$
 (14)

which clearly demonstrates the dispersive nature of singlet
exciton diffusion. Nevertheless, at high temperatures and large
Förster radius, since equilibrium can be established during
the exciton lifetime, the diffusion coefficient approaches its
equilibrium, time-independent, value.

In obtaining Eq. (13) for the diffusion length, the diffusion 509 coefficient at time  $t = \tau$  has been used in the calculations. 510 However, since the exciton transport occurs almost entirely in 511 the nonequilibrium regime and the diffusion coefficient is time-512 dependent, using  $D(t = \tau)$  may result in an underestimation 513 of the diffusion length. This argument shows why an additional 514 factor was required to fit the theory with the kMC results in 515 Fig. 5. One can estimate this factor by using the following 516

relation for the diffusion length of excitons :

$$L_D = \sqrt{\int_0^\tau D(t) \mathrm{d}t}.$$
 (15)

Using Eq. (14) we have

$$L_D \approx \sqrt{D(\tau)\tau} \int_0^\tau (t/\tau)^{-2/3} \mathrm{d}(t/\tau) = \sqrt{3} \times \sqrt{D(\tau)\tau}.$$
(16)

The factor  $\sqrt{3}$  justifies the additional factor used in Fig. 5 to 519 match the theory with the kMC results. 520

## IV. CONCLUSION

A theory for singlet exciton hopping transport has been 522 developed and tested. It describes diffusive transport via long-523 range Förster transfer in a Gaussian distribution of localized 524 states through a multiple-trapping mechanism, with the TE 525 playing the role of the mobility edge. The theory provided 526 in this paper fully describes the transition from equilibrium 527 to nonequilibrium transport. The global validity range of the 528 theory is illustrated by comparison to Monte Carlo simulations. 529 We find that for Förster radius values smaller than 5 nm, 530 typical in organic semiconductors, exciton transport occurs 531 mainly in the nonequilibrium regime and the diffusion length 532 deviates from the cubic dependence upon the Förster radius. 533 An important feature of the theory is that it takes into account 534 explicitly the temporal evolution of the spectral relaxation 535 energy and diffusivity and can be used to understand time-gated 536 spectroscopic experiments in a wide range of disordered semi- 537 conducting materials. Understanding the exciton dynamics is 538 also important for exploiting novel device applications. In the 539 current paper, we take a step toward this goal and anticipate 540 that it will motivate further studies. In future work, we hope 541 to tackle the excitation density dependence of the relaxation 542 dynamics and transport in spatially correlated disordered 543 systems. 544

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# APPENDIX A: POSITION OF THE TRANSPORT ENERGY 553

According to Eq. (1), the upward exciton jump rate is given 554 by 555

$$\nu(\varepsilon_d \to \varepsilon_a) = \frac{1}{\tau} \left(\frac{R_{\rm F}}{R}\right)^6 \exp\left(-\frac{\varepsilon_a - \varepsilon_d}{k_{\rm B}T}\right), \quad (A1)$$

where  $\varepsilon_a - \varepsilon_d > 0$  is the difference between the acceptor and 556 donor energy. Let us denote this rate by  $\nu_{\uparrow}(\varepsilon_d, \varepsilon_a, R)$ . For steep 557 energy distributions, the typical upward jump distance is given 558

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559 by [Eq. (4) in the main text]

$$R_{\varepsilon_a} = \left[\frac{4\pi}{3} \int_{-\infty}^{\varepsilon_a} g(\varepsilon) f'(\varepsilon, \varepsilon_F) \mathrm{d}\varepsilon\right]^{-1/3}.$$
 (A2)

<sup>560</sup> Now, according to the standard approach of calculating the TE <sup>561</sup> level, we seek to find if such an acceptor energy level exists <sup>562</sup> that it maximizes all typical upward jumps, independent of the <sup>563</sup> donor energy. In other words, we look for a unique acceptor <sup>564</sup> energy,  $\varepsilon_{tr}$ , that meets the condition

$$\frac{\partial \nu_{\uparrow}(\varepsilon_d, \varepsilon_a, R_{\varepsilon_a})}{\partial \varepsilon_a}\Big|_{\varepsilon_a = \varepsilon_{tr}} = 0.$$
(A3)

<sup>565</sup> By algebraic manipulation of the above equation, we obtain <sup>566</sup> Eq. (5).

# 567 APPENDIX B: DIFFUSION COEFFICIENT

In this appendix, a general expression for the diffusion coefficient is obtained, from which the time-dependency of the diffusion coefficient and the singlet diffusion length can be extracted. First, we note that the integral in the numerator of Eq. (12) can be rewritten as

$$\exp\left(\frac{\varepsilon_{tr}-\varepsilon_m}{k_{\rm B}T}\right)\int_{-\infty}^{\varepsilon_{tr}}\exp\left(\frac{\varepsilon_m-\varepsilon}{k_{\rm B}T}\right)g(\varepsilon)f'(\varepsilon,\varepsilon_m)\mathrm{d}\varepsilon,\tag{B1}$$

<sup>573</sup> where, for brevity, we have used  $\varepsilon_m$  for  $\varepsilon_m(t)$ . This, bearing in <sup>574</sup> mind that f' = 1 - f, can be simplified as

$$\exp\left(\frac{\varepsilon_{tr}-\varepsilon_m}{k_{\rm B}T}\right)\int_{-\infty}^{\varepsilon_{tr}}g(\varepsilon)f(\varepsilon,\varepsilon_m)\mathrm{d}\varepsilon.$$
 (B2)

<sup>575</sup> On the other hand, using Eq. (6), for the exponential term in <sup>576</sup> the above equation we have

$$\exp\left(\frac{\varepsilon_{tr} - \varepsilon_m}{k_{\rm B}T}\right) = \frac{t}{\tau\theta} \left(\frac{R_{\rm F}}{R_{\varepsilon_{tr}}}\right)^6.$$
 (B3)

<sup>577</sup> Using these simplifications, and if we define <sup>578</sup>  $n' = \int_{-\infty}^{\varepsilon_{tr}} g(\varepsilon) f(\varepsilon, \varepsilon_m) d\varepsilon$  and  $N' = \int_{-\infty}^{\varepsilon_{tr}} g(\varepsilon) d\varepsilon$ , we obtain

$$D(t) = \frac{\theta}{t} R_{\varepsilon_{tr}}^2 \frac{N' - n'}{n'},$$
(B4)

<sup>579</sup> that, using Eq. (4), can be rewritten as

$$D(t) = \frac{\theta}{t} \left(\frac{4\pi}{3}\right)^{-2/3} \frac{\left(N' - n'\right)^{1/3}}{n'}.$$
 (B5)

<sup>580</sup> From this general result, one can obtain Eq. (13) for the <sup>581</sup> diffusion length  $L_D = \sqrt{D(\tau)\tau}$ .

To obtain the time-evolution of the diffusion coefficient in nonequilibrium regime, we use the fact that the demarcation energy is high at short and intermediate times such that we can write  $f \approx 1$  and  $1 - f \approx \exp\{[\varepsilon - \varepsilon_m(t)]/k_{\rm B}T\}$ . Therefore, since  $\varepsilon_m(t) = \varepsilon_m(\tau) - k_{\rm B}T \ln(t/\tau)$ , we can obtain the following time-dependent behavior for the diffusion coefficient (valid only for the nonequilibrium regime):

$$D(t) \propto (t/\tau)^{-2/3}$$
. (B6)

<sup>589</sup> On the other hand, at the equilibrium regime where the <sup>590</sup> demarcation energy lies deep in the energy distribution, we can use the approximation  $f \approx \exp\{-[\varepsilon - \varepsilon_m(t)]/k_{\rm B}T\}$  and 591  $N' - n' \approx N'$ . These approximations result in a stationary 592 diffusion coefficient as 593

$$D_{\rm st} \propto (t/\tau)^0.$$
 (B7)

### APPENDIX C: SCALING BEHAVIOR OF THE 594 DIFFUSION LENGTH 595

Equation (3) shows that at a given density n, the Fermi level 596  $\varepsilon_F$  is determined by the temperature and the width of the energy 597 distribution. By expressing this integral in terms of a new 598 variable  $x = \varepsilon / \sigma$ , we find that the temperature-normalized 599 Fermi level, that is,  $\varepsilon_F/k_BT$ , is a function of the dimensionless 600 disorder parameter  $\sigma/k_{\rm B}T$ . Using this result, and the same 601 change-of-variable for the integral of Eq. (5), we find that 602  $\varepsilon_{tr}/\sigma$  is a function of  $\sigma/k_{\rm B}T$ . Inspection of Eq. (9) for the 603 demarcation level shows that the same scaling behavior holds 604 for  $\varepsilon_m(\tau)/\sigma$ , and since  $\varepsilon_{\tau}$  is the energy at which the product 605  $g(\varepsilon) f[\varepsilon, \varepsilon_m(\tau)]$  maximizes, we find that  $\varepsilon_{\tau}/\sigma$  also scales with 606  $\sigma/k_{\rm B}T$ . Using the above scaling features and Eq. (13), we 607 obtain that  $L_D = L_D(\sigma/k_BT)$ . 608

# APPENDIX D: AVERAGING METHOD FOR THE 609 CALCULATION OF THE RELAXATION ENERGY 610

The equilibrium energy  $\varepsilon_{\infty}$  can be calculated in two fill different ways. As pointed out in the main text, we have fill introduced  $\varepsilon_{\infty}$  as the energy that maximizes the product fill  $g(\varepsilon)f(\varepsilon, \varepsilon_F)$ . Accordingly, the relaxation energy  $\varepsilon_{\tau}$  can be found by maximizing the product  $g(\varepsilon)f[\varepsilon, \varepsilon_m(\tau)]$ . On the found by maximizing the product  $g(\varepsilon)f[\varepsilon, \varepsilon_m(\tau)]$ . On the fill other hand, one can define the equilibrium or relaxation energy for as the average energy of the carriers. In this definition, the fill equilibrium energy is calculated as

$$\langle \varepsilon \rangle = \frac{\int \varepsilon g(\varepsilon) f(\varepsilon, \varepsilon_F) d\varepsilon}{\int g(\varepsilon) f(\varepsilon, \varepsilon_F) d\varepsilon}.$$
 (D1)

To obtain  $\varepsilon_{\tau}$ , one needs to replace  $\varepsilon_F$  with  $\varepsilon_m(\tau)$  in the 619 above equation. We find that the averaging method gives 620 excellent agreement with Monte Carlo simulations. In compar- 621 ison, the method of maximizing the product  $f \times g$  results in 622 slightly lower values for the equilibrium energy at intermediate 623 and higher temperatures and a more pronounced minimum 624 (Fig. 3). However, since the product  $f \times g$  is approximately 625 a symmetric function of energy, the two definitions result in 626 the same overall trend and similar values for the relaxation 627 energy. From a practical point of view, while the first method 628 is numerically more tractable, the second definition is most 629 suitable for comparing with kMC simulation results, where 630 the relaxation energy is obtained by averaging over different 631 exciton trajectories. Throughout this paper, we adopted the 632 first method, except in Figs. 4 and 8 where we compare  $\varepsilon_{\tau}$ 633 with kMC calculations and experimental results. 634

- [1] C. J. Bardeen, Annu. Rev. Phys. Chem. 65, 127 (2014).
- [2] O. V. Mikhnenko, P. W. Blom, and T.-Q. Nguyen, Energy Environ. Sci. 8, 1867 (2015).
- [3] G. M. Akselrod, F. Prins, L. V. Poulikakos, E. M. Lee, M. C. Weidman, A. J. Mork, A. P. Willard, V. Bulović, and W. A. Tisdale, Nano Lett. 14, 3556 (2014).
- [4] K. F. Chou and A. M. Dennis, Sensors 15, 13288 (2015).
- [5] C. Curutchet, A. Franceschetti, A. Zunger, and G. D. Scholes, J. Phys. Chem. C 112, 13336 (2008).
- [6] D. Geißler and N. Hildebrandt, Anal. Bioanal. Chem. 408, 4475 (2016).
- [7] J. Lefebvre and P. Finnie, J. Phys. Chem. C 113, 7536 (2009).
- [8] A. Ishii, M. Yoshida, and Y. K. Kato, Phys. Rev. B 91, 125427 (2015).
- [9] B. A. Ruzicka, R. Wang, J. Lohrman, S. Ren, and H. Zhao, Phys. Rev. B 86, 205417 (2012).
- [10] D. Schilling, C. Mann, P. Kunkel, F. Schöppler, and T. Hertel, J. Phys. Chem. C 119, 24116 (2015).
- [11] V. Sundström, T. Pullerits, and R. van Grondelle, J. Phys. Chem. B 103, 2327 (1999).
- [12] G. J. Hedley, A. Ruseckas, and I. D. W. Samuel, Chem. Rev. 117, 796 (2017).
- [13] J. Hou, O. Inganäs, R. H. Friend, and F. Gao, Nat. Mater. 17, 119 (2018).
- [14] F. Zhao and D. Ma, Mater. Chem. Front. 1, 1933 (2017).
- [15] C. Liu, Z. Li, T. J. Hajagos, D. Kishpaugh, D. Y. Chen, and Q. Pei, ACS Nano 11, 6422 (2017).
- [16] X. Ma, O. Roslyak, J. G. Duque, X. Pang, S. K. Doorn, A. Piryatinski, D. H. Dunlap, and H. Htoon, Phys. Rev. Lett. 115, 017401 (2015).
- [17] V. May and O. Kühn, *Charge and Energy Transfer Dynamics in Molecular Systems* (John Wiley & Sons, Weinheim, Germany, 2008).
- [18] A. Köhler and H. Bässler, *Electronic Processes in Organic Semi*conductors: An Introduction (John Wiley & Sons, Weinheim, Germany, 2015).
- [19] S. Athanasopoulos, E. V. Emelianova, A. B. Walker, and D. Beljonne, Phys. Rev. B 80, 195209 (2009).
- [20] R. Kersting, U. Lemmer, R. F. Mahrt, K. Leo, H. Kurz, H. Bässler, and E. O. Göbel, Phys. Rev. Lett. 70, 3820 (1993).
- [21] S. Athanasopoulos, E. Hennebicq, D. Beljonne, and A. B. Walker, J. Phys. Chem. C 112, 11532 (2008).
- [22] I. Rörich, O. V. Mikhnenko, D. Gehrig, P. W. M. Blom, and N. I. Crăciun, J. Phys. Chem. B **121**, 1405 (2017).
- [23] S. M. Menke and R. J. Holmes, Energy Environ. Sci. 7, 499 (2014).
- [24] J. D. A. Lin, O. V. Mikhnenko, J. Chen, Z. Masri, A. Ruseckas, A. Mikhailovsky, R. P. Raab, J. Liu, P. W. M. Blom, M. A. Loi, C. J. Garcia-Cervera, I. D. W. Samuel, and T.-Q. Nguyen, Mater. Horiz. 1, 280 (2014).
- [25] F. Fennel and S. Lochbrunner, Phys. Rev. B 85, 094203 (2012).
- [26] S. C. J. Meskers, J. Hübner, M. Oestreich, and H. Bässler, J. Phys. Chem. B 105, 9139 (2001).
- [27] L. M. Herz, C. Silva, A. C. Grimsdale, K. Müllen, and R. T. Phillips, Phys. Rev. B 70, 165207 (2004).
- [28] C. Madigan and V. Bulović, Phys. Rev. Lett. 96, 046404 (2006).

- [29] O. Mikhnenko, F. Cordella, A. Sieval, J. Hummelen, P. Blom, and M. Loi, J. Phys. Chem. B 112, 11601 (2008).
- [30] S. T. Hoffmann, H. Bässler, J.-M. Koenen, M. Forster, U. Scherf, E. Scheler, P. Strohriegl, and A. Köhler, Phys. Rev. B 81, 115103 (2010).
- [31] M. Skolnick, P. Tapster, S. Bass, A. Pitt, N. Apsley, and S. Aldred, Semicond. Sci. Technol. 1, 29 (1986).
- [32] J. D. Lin, O. V. Mikhnenko, T. S. van der Poll, G. C. Bazan, and T.-Q. Nguyen, Adv. Mater. 27, 2528 (2015).
- [33] A. D. Stein, K. A. Peterson, and M. D. Fayer, J. Chem. Phys. 92, 5622 (1990).
- [34] S. D. Baranovskii, R. Eichmann, and P. Thomas, Phys. Rev. B 58, 13081 (1998).
- [35] K. M. Gaab and C. J. Bardeen, J. Phys. Chem. A 108, 10801 (2004).
- [36] J. M. Jean, C.-K. Chan, G. Fleming, and T. G. Owens, Biophys. J. 56, 1203 (1989).
- [37] Y. Jia, J. Jean, M. Werst, C. Chan, and G. Fleming, Biophys. J. 63, 259 (1992).
- [38] S. Athanasopoulos, S. T. Hoffmann, H. Bässler, A. Köhler, and D. Beljonne, J. Phys. Chem. Lett. 4, 1694 (2013).
- [39] S. T. Hoffmann, S. Athanasopoulos, D. Beljonne, H. Bässler, and A. Köhler, J. Phys. Chem. C 116, 16371 (2012).
- [40] T. A. Papadopoulos, L. Muccioli, S. Athanasopoulos, A. B. Walker, C. Zannoni, and D. Beljonne, Chem. Sci. 2, 1025 (2011).
- [41] E. V. Emelianova, S. Athanasopoulos, R. J. Silbey, and D. Beljonne, Phys. Rev. Lett. 104, 206405 (2010).
- [42] S. Athanasopoulos, L. Alfonso Hernandez, D. Beljonne, S. Fernandez-Alberti, and S. Tretiak, J. Phys. Chem. Lett. 8, 1688 (2017).
- [43] J. A. Bjorgaard and M. E. Köse, RSC Adv. 5, 8432 (2015).
- [44] T.-S. Ahn, N. Wright, and C. J. Bardeen, Chem. Phys. Lett. 446, 43 (2007).
- [45] M. Grünewald and P. Thomas, Phys. Status Solidi B **94**, 125 (1979).
- [46] S. Baranovskii, P. Thomas, and G. Adriaenssens, J. Non-Cryst. Solids 190, 283 (1995).
- [47] S. Baranovskii, T. Faber, F. Hensel, and P. Thomas, J. Phys.: Condens. Matter 9, 2699 (1997).
- [48] B. Valeur and M. N. Berberan-Santos, *Molecular Fluorescence: Principles and Applications* (John Wiley & Sons, Weinheim, Germany, 2012).
- [49] S. Baranovskii, Phys. Status Solidi B 251, 487 (2014).
- [50] S. Baranovskii and T. Faber, Phys. Status Solidi B 218, 59 (2000).
- [51] B. Movaghar, M. Grünewald, B. Ries, H. Bässler, and D. Würtz, Phys. Rev. B 33, 5545 (1986).
- [52] H. Bässler, Phys. Status Solidi B 175, 15 (1993).
- [53] T. Tiedje and A. Rose, Solid State Commun. 37, 49 (1981).
- [54] J. Bisquert, Phys. Rev. E 72, 011109 (2005).
- [55] O. V. Mikhnenko, M. Kuik, J. Lin, N. van der Kaap, T. Nguyen, and P. W. M. Blom, Adv. Mater. 26, 1912 (2013).
- [56] M. Ansari-Rad, Y. Abdi, and E. Arzi, J. Appl. Phys. 112, 074319 (2012).
- [57] S. D. Baranovskii, H. Cordes, F. Hensel, and G. Leising, Phys. Rev. B 62, 7934 (2000).
- [58] J. O. Oelerich, D. Huemmer, and S. D. Baranovskii, Phys. Rev. Lett. 108, 226403 (2012).

- [59] S. Athanasopoulos, E. V. Emelianova, A. B. Walker, and D. Beljonne, Proc. SPIE 7722, 772214 (2010).
- [60] Q. Zhang, C. Zhang, L. Cao, Z. Wang, B. An, Z. Lin, R. Huang, Z. Zhang, C. Wang, and W. Lin, J. Am. Chem. Soc. 138, 5308 (2016).
- [61] J. Orenstein and M. Kastner, Solid State Commun. 40, 85 (1981).
- [62] I. Fishchuk, V. I. Arkhipov, A. Kadashchuk, P. Heremans, and H. Bässler, Phys. Rev. B 76, 045210 (2007).
- [63] O. Rubel, S. D. Baranovskii, K. Hantke, B. Kunert, W. W. Rühle, P. Thomas, K. Volz, and W. Stolz, Phys. Rev. B 73, 233201 (2006).
- [64] C. Karcher, K. Jandieri, B. Kunert, R. Fritz, M. Zimprich, K. Volz, W. Stolz, F. Gebhard, S. D. Baranovskii, and W. Heimbrodt, Phys. Rev. B 82, 245309 (2010).
- [65] G. Schnönherr, R. Eiermann, H. Bässler, and M. Silver, Chem. Phys. 52, 287 (1980).